

# Evaluation of nutrition models to estimate performance of young dairy calves: a meta-analytical study under tropical conditions

V. L. Souza<sup>1†</sup>, J. K. Drackley<sup>2</sup>, R. Almeida<sup>3</sup>, C. M. M. Bittar<sup>1</sup>, T. Z. Albertini<sup>1</sup>, S. Y. Morrison<sup>2</sup> and D. P. D. Lanna<sup>1</sup>

<sup>1</sup>Department of Animal Science, University of São Paulo (ESALQ-USP), Piracicaba, São Paulo, 13418-900, Brazil; <sup>2</sup>Department of Animal Sciences, University of Illinois at Urbana-Champaign, Urbana, IL, 61801, USA; <sup>3</sup>Department of Animal Science, Federal University of Paraná, Curitiba, Paraná, 80035-050, Brazil

(Received 5 February 2016; Accepted 12 April 2016; First published online 23 May 2016)

*Mathematical models are important tools to estimate nutritional requirements and animal growth. Very few calf models generated from other countries with different feeding programs, environment and production systems have been evaluated. The objective of this paper is to evaluate two calf models: (i) the National Research Council (NRC) in 2001 and (ii) the updates published by Van Amburgh and Drackley in 2005 and inputted into Agricultural Modeling and Training Systems (AMTS, version 3.5.8). Data from 16 previous studies involving 51 diets for dairy calves under tropical conditions (n = 485 calves, initial BW 37.5 ± 4.35 kg and weaning weight of 62.0 ± 10.16 kg) were used. The calves were fed with whole milk, milk replacer or fermented colostrum, plus starter (20.9 ± 1.78% of CP). The accuracy of the average daily gain (ADG) prediction was evaluated by mean bias, mean square prediction error (MSPE), concordance correlation coefficient, bias correction factor (Cb), and regression between the observed and predicted values. The ADG observed from birth to weaning was 0.452 ± 0.121 kg/day. Calves fed with whole milk had greater ADG compared with calves fed milk replacer (0.477 v. 0.379 kg/day) during the milk-feeding period. When all data were pooled (n = 51 diets), predictions had a mean bias of -0.019 and 0.068 kg/day for energy-allowable gain using NRC and AMTS models, respectively. The regression equation between observed and predicted values obtained from energy of diets showed an intercept different from zero (P < 0.0001) and slope that differed from unity (P < 0.0001). In a second evaluation, when calves were fed only milk replacer, the energy-allowable gain from AMTS showed the lowest mean bias (0.008 kg/day) and 82.1% of the MSPE value originated from random errors. The lowest MSPE, the higher Cb value and no significant slope bias (P > 0.05) indicate that the AMTS growth model resulted in accurate predictions for calves fed with milk replacer. However, within these latter two approaches, the goodness of fit (R<sup>2</sup>) was low, representing low precision. The weight gain estimated by the energy available from the diet was overestimated by 19 g/day when calculated by the NRC and underestimated by 68 g/day when calculated by AMTS. The reasons for this discrepancy need to be understood, for only then new models could be developed and parameterized to estimate animal performance in tropical conditions more accurately and precisely.*

**Keywords:** calf models, cross-bred calves, growth, meta-analysis, prediction

## Implications

The development of an accurate calf model has been challenging because several factors affect growth such as breed, colostrum and feeding programs, facilities and environmental conditions. Because of the conventional feeding system (e.g. 4 l/calf at each of two daily feedings) and tropical conditions, the animals evaluated in this study showed poor weight gains. The low energy to protein ratio likely reduced calf growth rates. Currently available calf models can be used to predict calf growth during pre-weaning phase in tropical conditions, but with low precision.

## Introduction

Mathematical models are important tools to estimate the development, nutritional requirements, growth and performance of animals. The development of models is based on known facts and logical assumptions, and then the predictions from the model are compared with independent real data (Vanden Berg, 1980). The evaluation of different models is important to verify the accuracy and precision of the estimated values in different environmental conditions, genotypes and managements.

Over the last few decades, several nutrition models (Institute National de la Recherche Agronomique, 1989; Commonwealth Scientific and Industrial Research Organisation, 1990;

† E-mail: veridianalsousa@yahoo.com.br

Fox *et al.*, 1992; Agricultural and Food Research Council (AFRC), 1993; National Research Council (NRC), 2001; Tylutki *et al.*, 2008) were developed, evaluated or updated, and used to estimate requirements and performance of animals. However, some groups such as dairy calves less than 2 months of age are overlooked on the farms.

The last update of *Nutrient requirements of dairy cattle* (NRC, 2001) organized a chapter on the Nutrient Requirements of the Young Calf and described three phases of development of animals related to digestive function. The first one is a liquid-feeding phase, in which all or most of the nutrient requirements are met by milk or milk replacer. In the transition phase, both liquid diet and starter contribute to the supply of nutrient requirements of the calf. In the third phase, called ruminant, the nutrient requirements are met by microbial fermentation of solid feeds in the reticulo-rumen (Davis and Clark, 1981; Davis and Drackley, 1998).

Most dairy cattle nutritionists in Brazil have adopted the NRC (2001) and the Cornell Net Carbohydrate and Protein System (Fox *et al.*, 2004; Tylutki *et al.*, 2008) models to estimate the requirements and performance of dairy cows, heifers and dairy calves. These models were developed in North America under temperate climatic conditions and based on different milk replacers, calf starters and management. Therefore, some characteristics to the specific Brazilian environmental conditions, management and animal genotypes should be considered: (1) frequently the calf is a Holstein-Zebu cross-bred; (2) a calf <2 months of age is often lighter than a Holstein calf; (3) the temperature is higher during the summer and there is no rigorous winter; (4) the calf is fed with around 4 l/day of non-saleable (waste) milk or raw (saleable or non-saleable) milk.

Consequently, the Brazilian dairy herd is mainly made up of cross-bred cows fed under tropical conditions. Currently, few models have been evaluated to estimate the requirements and performance of young calves in different feeding strategies and diversity of climate. The purpose of the present study was to evaluate the NRC (2001) and Agricultural Modeling and Training Systems (AMTS) models for predicting gain (energy and protein-allowable gain) of young dairy calves under tropical conditions.

## Material and methods

### Data

The data used for parameter estimation were collected from Brazilian studies indexed in the Scientific Electronic Library Online (2014), an electronic library covering a selected collection of Brazilian scientific journals. Initially, an extensive electronic search of scientific literature of dairy calf trials was conducted. Methods for the literature search and screening process have been described previously (Olsen, 1995; Sauvant *et al.*, 2008). The meta-analysis methods may be more economically viable when compared with high cost of using experimental herds to carry out studies in dairy science (Fuentes-Pila *et al.*, 2003).

The data set was compiled using data from dairy calves in the pre-weaning phase. Studies included in this meta-analysis were selected based on specific criteria: studies conducted in Brazil using dairy calves during the pre-weaning phase; studies with description of the starter composition during the entire experimental period; studies that included weaning weights; studies that included liquid diet (milk and milk replacer) composition, starter intake, liquid diet intake and average daily gain (ADG). Following rigorous screening for appropriate subject matter, quality of trial design and adequate statistical reporting, data were extracted for inclusion in the data set. Consequently, the data set was analyzed to verify its biological coherence. Therefore, outliers were removed from the data set before the evaluation of models.

Data from 16 previous studies involving 51 diets for dairy calves under tropical conditions (Table 1) were used to evaluate the NRC (2001) and AMTS (AMTS.Cattle.Pro™ 2015, version 3.5.8) calf models. Data for diet composition (Table 2) and animal performance (Table 3) were collected and summarized. Actual calf weaning weights, liquid diet and starter composition, and intake were used as inputs into the NRC (2001) and AMTS models. The temperature was set at 20°C, therefore, the temperature was considered to be thermoneutral and no adjustments were made for environment by either NRC or AMTS.

Treatment means were used for evaluation of the models. Diets included whole milk, commercial milk replacer or anaerobically fermented colostrum (colostrum silage). In addition, when liquid diet and starter composition were not analyzed for some nutrients, the composition used was from NRC (2001). The animal description and average of the actual starter intake and liquid diet for the entire pre-weaning period was used to calculate a predicted ADG. In the studies, the gain during pre-weaning was calculated from birth and weaning weights. The ADG observed during the pre-weaning phase was used to evaluate the models.

### Statistical analysis

The data set was submitted to graphical analysis of SAS® (SAS Institute, 2008) to perform data exploration and observe biological coherence. Descriptive statistics were generated using the MEANS and FREQ procedures. The assessment of outliers and relationships between observed and model-predicted ADG were generated by using the REG procedure of SAS®. The accuracy of the ADG predictions of the NRC and AMTS models were tested by analysis of the mean bias (bias), mean square error of prediction (MSPE) and its decomposition (Bibby and Toutenburg, 1977), concordance correlation coefficient and accuracy or bias correction factor (Cb) (Lin, 1989), the goodness of fit ( $R^2$ ) of the linear regression between observed (X-axis) and model-predicted (Y-axis) values and probability to test for intercept = 0 and slope = 1, for all evaluations as described by Tedeschi (2006). Statistical analyses for model adequacy were performed with R version 3.1.1 (R Development Core Team, 2014) and the Model Evaluation System (Tedeschi, 2006).

**Table 1** Studies selected from Brazilian journals for compiling the data set used to evaluate the calf models in the National Research Council (2001) and Agricultural Modeling and Training Systems

References	Treatments used (n)	Liquid diets	Localization	State
Aita <i>et al.</i> R. Bras. Zootec., v.35, n.1, p.193–202, 2006	3	Whole/replacer	EMBRAPA	RS
Azevedo <i>et al.</i> Rev. Bras. Saúde Prod. Anim., v.15, n.1, p.237–247, 2014	1	Whole	UFMG	MG
Batista <i>et al.</i> Arq. Bras. Med. Vet. Zootec., v.60, n.1, p.185–191, 2008	4	Whole	UFMG	MG
Bittar <i>et al.</i> R. Bras. Zootec., v.38, n.8, p.1561–1567, 2009	2	Whole/replacer	CPNA	SP
Chaves <i>et al.</i> Rev. Bras. Zootec., v.28, n.5, p.1075–1085, 1999	3	Whole	EMBRAPA	MG
Ferreira <i>et al.</i> Arq. Bras. Med. Vet. Zootec., v.65, n.5, p.1357–1366, 2013	1	Replacer/colostrum silage	USP ESALQ	SP
Jorge <i>et al.</i> R. Bras. Zootec., v.31, n.1, p.192–204, 2002	5	Whole	UEM	PR
Lima <i>et al.</i> Ciênc. Rural, v.43, n.11, p.2056–2062, 2013	4	Whole/cheese whey	UFERSA	RN
Lizieire <i>et al.</i> Ciênc. Rural, v.32, n.5, p.835–840, 2002	3	Whole	PESAGRO	RJ
Mancio <i>et al.</i> R. Bras. Zootec., v.34, n.4, p.1314–1319, 2005	2	Whole/colostrum silage	UFV	MG
Meyer <i>et al.</i> Sci. Agric., v.58, n.2, p.215–221, 2001	2	Whole/replacer	USP ESALQ	SP
Gonsalves Neto <i>et al.</i> Rev. Bras. Saúde Prod. An., v.9, n.4, p. 726–733, 2008	2	Replacer	UESB	BA
Sandi and Mühlbach, Ciênc. Rural, v.31, n.3, p.487–490, 2001	4	Whole	PUC	RS
Schalch <i>et al.</i> Rev. Bras. Zootec., v.30, n.1, p.280–285, 2001	4	Whole	USP	SP
Silva <i>et al.</i> R. Bras. Zootec., v.41, n.3, p.746–752, 2012	3	Replacer	USP ESALQ	SP
Vasconcelos <i>et al.</i> Acta Vet. Brasilica, v.3, n.4, p.163–171, 2009	8	Whole/replacer	UFSM	RS

Whole = whole saleable milk; replacer = commercial milk replacer; EMBRAPA = the Brazilian Agricultural Research Corporation; RS = Rio Grande do Sul; UFMG = Federal University of Minas Gerais; MG = Minas Gerais; CPNA = Researcher Center of Animal Nutrition Nutron Company; SP = São Paulo; USP ESALQ = University of São Paulo; UEM = The State University of Maringá; PR = Paraná; UFERSA = Federal Rural University of the Semiarid Region; RN = Rio Grande do Norte; PESAGRO = Agricultural Research Company of the State of Rio de Janeiro; RJ = Rio de Janeiro; colostrum silage = anaerobically fermented colostrum/transition milk; UFRV = Federal University of Viçosa; UESB = State University of South East Bahia; BA = Bahia; PUC = Pontifical Catholic University; UFSM = Federal University of Santa Maria.

**Table 2** Intake, diet composition and chemical analysis from studies used to estimate the weight gains of dairy calves in tropical conditions

Variables	n	Mean	SD	Minimum	Maximum
Experimental period (days)	51	65	13	50	90
Colostrum intake (l/day)	28	3.9	1	2	4
Colostrum available (day)	35	3	1	2	5
Interval colostrum (hours)	21	12	0	12	12
Milk intake (l)	37	3.8	0.6	2.0	5.4
Milk DM (g/kg)	11	119.6	5.5	104.7	124.9
Milk fat (% of DM)	3	26.69	2.53	25.23	29.61
Milk protein (% of DM)	3	24.76	1.94	23.63	27.00
Milk ash (% of DM)	3	6.19	0.22	6.06	6.44
Milk feeding (times daily)	37	1.9	0.3	1.0	2.0
Milk replacer intake (l/day)	13	3.77	0.44	3.00	4.00
Milk replacer powder DM (%)	13	92	2	88	94
Milk replacer fat (% of DM)	13	15.66	3.26	10.00	20.00
Milk replacer protein (% of DM)	13	21.16	1.84	18.15	23.08
Milk replacer calcium (% of DM)	2	0.85	0.07	0.80	0.90
Milk replacer phosphorus (% of DM)	2	0.65	0.07	0.60	0.70
Milk replacer ash (% of DM)	7	5.91	1.29	4.87	7.29
Milk replacer crude fiber (% of DM)	7	1.96	1.33	0.54	3.03
Starter intake (pre-weaning phase average, g/day)	51	517.76	201.27	180.00	960.00
Starter DM (%)	39	88.66	3.46	80.20	92.18
Starter fat (% of DM)	40	3.64	1.24	2.30	7.23
Starter CP (% of DM)	51	20.91	1.78	17.37	23.60
Starter NDF (% of DM)	28	20.75	9.59	9.47	39.44
Starter ADF (% of DM)	20	10.08	5.69	4.60	23.10
Starter crude fiber (% of DM)	23	5.90	3.31	2.48	11.92
Starter ash (% of DM)	31	7.49	2.75	4.21	12.60
Starter calcium (% of DM)	15	1.17	0.70	0.10	1.90
Starter phosphorus (% of DM)	15	0.60	0.04	0.53	0.68
Starter TDN (% of DM)	20	83.44	6.17	71.32	88.41

DM = dry matter; TDN = total digestible nutrients.

**Table 3** Animal performance from studies used to estimate the average daily gain of dairy calves in tropical conditions

Variables	<i>n</i>	Mean	SD	Minimum	Maximum
Age at the start of the study (days)	51	5	6	1	28
Calf weaning age (days)	51	58	11	28	81
Initial BW (kg)	47	37.52	4.35	27.60	48.28
Weaning BW (kg)	51	62.02	10.16	43.73	81.60
Metabolic BW (BW <sup>0.75</sup> )	51	22.05	2.71	17.00	27.10
Net energy for maintenance (NE <sub>m</sub> , Mcal)	51	1.90	0.23	1.46	2.33
Net energy for gain (NE <sub>g</sub> , Mcal)	51	0.99	0.37	0.41	1.92
Average daily gain, pre-weaning phase (kg/day)	51	0.452	0.121	0.235	0.741

**Table 4** Empirical equations developed from National Research Council (2001) and Van Amburgh and Drackley (2005)

Descriptions	Units	Equations
<i>Nutrient requirements of dairy cattle 2001</i>		
Net energy requirement maintenance	NE <sub>m</sub> (Mcal)	0.086 × LW <sup>0.75</sup>
Metabolizable energy (ME) for maintenance	ME <sub>m</sub> (Mcal)	0.100 × LW <sup>0.75</sup>
ME for daily live weight gain requirement	ME <sub>g</sub> (Mcal)	(0.84 × LW <sup>0.355</sup> × LWG <sup>1.2</sup> )
Metabolizable energy requirement	ME (Mcal/day)	0.1 × LW <sup>0.75</sup> + (0.84 × LW <sup>0.355</sup> ) × (LWG <sup>1.2</sup> )
Apparent digestible protein requirement	ADP (g/day)	6.25 × [1/BV (E + G + M × D) – M × D]
Biological value	BV	Milk and milk replacer = 0.8 or starter = 0.7
Endogenous urinary N	E (g/day)	0.2 × LW <sup>0.75</sup>
Amount of N in gain	G (g)	30 g N/kg LWG
Metabolic fecal N	M (g)	1.9 g/kg of DM consumed (D) from milk or milk replacer and 3.3 g/kg of starter DM consumed
Efficiency of use of ME for maintenance	k <sub>m</sub>	NE <sub>m</sub> /0.825 (0.86 for milk proteins and 0.75 for starter)
Efficiency of use of ME for gain	k <sub>g</sub>	NE <sub>g</sub> /0.652 (0.69 for milk proteins and 0.57 for starter)
Efficiency of conversion of DE to ME	DE (Mcal)	ME/0.934 (0.96 for milk proteins and 0.88 for starter)
Conversion of CP to ADP		ADP/0.8645 (93% for milk proteins and 75% for starter)
<i>Van Amburgh and Drackley (2005)</i>		
Energy requirements per unit of gain	ME (MJ/day)	~0.53
Retained energy	RE (Mcal/day)	0.4431 × EWG <sup>1.1684</sup> × EBW <sup>0.75</sup>
Efficiency of use of absorbed protein		0.70

DE = digestible energy; LW = live weight (kg); LWG = daily live weight gain (kg/day); DM = dry matter; EWG = empty weight gain (kg/day); EBW = empty BW (kg); NE<sub>g</sub> = net energy for growth (Mcal/kg).

### Nutrition models

The NRC (2001) and AMTS calf models were evaluated in this study. In the last years, experiments at Cornell University and the University of Illinois provided data to modify NRC (2001) equations for predicting growth performance by dairy heifer. The main equations used in this study are described in Table 4.

## Results

### Data

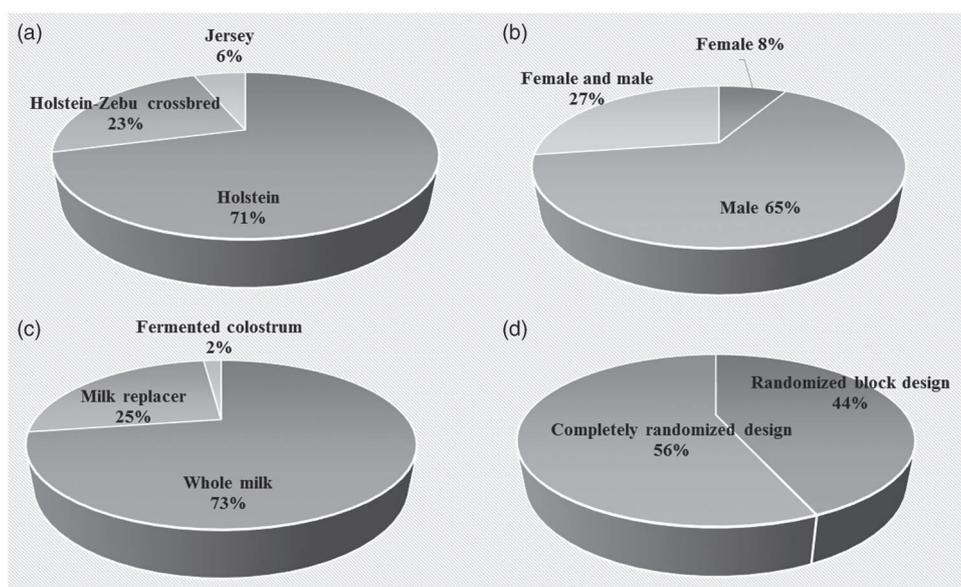
The data set included 51 treatment means collected from 16 experiments all performed in seven different states from Brazil (south, southeast and northeastern region). The starter intake and ADG observed from birth to weaning were 0.518 ± 0.201 and 0.452 ± 0.121 kg/day, respectively. The design, gender, calf genotype and liquid diet of the studies used in this evaluation are shown in the Figure 1. Most of

the studies were conducted with male Holstein calves fed whole milk.

### Evaluation

When all data were pooled (*n* = 51 diets), predictions had a mean bias of -0.019 and 0.068 kg/day for energy-allowable gain using NRC (2001) and AMTS models, respectively. The *R*<sup>2</sup> for energy-allowable gain was lower than for protein-allowable gain in both models (*R*<sup>2</sup> < 0.13). Indeed, a lower *R*<sup>2</sup> value represents less precise predictions for ADG from dietary energy. The protein-allowable gain over-predicted actual gains in both models (Table 5).

Calves that were fed whole milk had greater ADG compared with calves fed milk replacer (0.477 v. 0.379 kg/day, Table 6) during the milk-feeding period. In the second evaluation, when calves were fed only milk replacer the energy-allowable gain from AMTS showed the lowest mean bias (0.008 kg/day) and 82.1% of the MSPE value originates from random errors. The lowest MSPE (0.0092 kg<sup>2</sup>/day), the higher value of C<sub>b</sub> and



**Figure 1** Summary of calf breed (a), gender (b), liquid diet (c), design (d) from data set used to evaluate the *Nutrient requirements of dairy cattle 2001* and Agricultural Modeling and Training Systems (version 3.5.8) models.

**Table 5** Average daily gain (ADG) predicted by National Research Council (2001) and Agricultural Modeling and Training Systems from data pooled for all calf diets

	<i>Nutrient requirements of dairy cattle 2001</i>			Agricultural Modeling and Training Systems	
	ADG (kg/day)	Energy-allowable gain	ADP allowable gain	Energy-allowable gain	MP allowable gain
Mean (pre-weaning period)	0.452	0.471	0.553	0.384	0.616
Mean bias (Y-X)	–	–0.019	–0.101	0.068	–0.164
MSPE	–	0.017	0.018	0.020	0.038
<i>MSPE decomposition (%)</i>					
Mean bias	–	2.089	56.678	22.403	69.539
Systematic bias	–	28.696	3.985	15.858	11.962
Random errors	–	69.216	39.337	61.739	18.498
CCC	–	0.358	0.507	0.271	0.400
Pearson's (r)	–	0.363	0.703	0.330	0.704
Model accuracy (Cb)	–	0.986	0.721	0.821	0.569
MSE	–	0.012	0.007	0.013	0.007
Goodness of fit ( $R^2$ )	–	0.13	0.49	0.10	0.49
P value ( $a = 0$ )	–	0.0001	0.59	0.00005	0.03
P value ( $b = 1$ )	–	0.00004	0.03	0.0008	0.00001

ADP = apparently digested protein; MP = metabolizable protein; MSPE = mean square error of prediction; CCC = concordance correlation coefficient according to Lin (1989); Cb = bias correction factor; MSE = mean square error.

no significant slope bias ( $P > 0.05$ ) indicates that the AMTS model was accurate for calves fed with milk replacer (Table 6, Figure 2). However, within these latter two approaches, the goodness of fit ( $R^2$ ) had a low value.

## Discussion

### Data

In this data set 73% of calves were fed with  $3.8 \pm 0.6$  kg of whole milk per day. Similar to our study, Hotzel *et al.* (2014) reported that most calves were fed with up to 4 l of milk or

milk replacer per day, or the equivalent to 10% to 15% of BW. This survey was made from 242 small holder family farms in the South of Brazil. In a recent survey, Santos and Bittar (2015) reported that in three important milk production regions from Brazil, around 50% of the calves receive 4 l/day of liquid diet, but close to 25% are receiving 6 l/day. In this aspect, Khan *et al.* (2011) described that conventional feeding practices (4 l/day or 0.5 kg of solids) resulted in calves being hungry with negative effects on growth, health, welfare and future milk production. The management adopted in Brazil may represent an insufficient milk allowance for dairy calves. In addition, studies showed that

**Table 6** Average daily gain (ADG) predicted by National Research Council (2001) and Agricultural Modeling and Training Systems for calves fed milk replacer or whole milk

	ADG (kg/day)	Nutrient requirements of dairy cattle 2001		Agricultural Modeling and Training Systems	
		Energy-allowable gain	ADP allowable gain	Energy-allowable gain	MP allowable gain
<i>Milk replacer (n = 13)</i>					
Mean (pre-weaning period)	0.379	0.511	0.555	0.371	0.624
Mean bias (Y-X)	–	–0.132	–0.175	0.008	–0.245
MSPE	–	0.030	0.040	0.009	0.073
<i>MSPE decomposition (%)</i>					
Mean bias	–	56.788	76.27	0.685	81.514
Systematic bias	–	17.810	9.455	17.253	11.843
Random errors	–	25.401	14.274	82.062	6.644
CCC	–	0.211	0.264	0.403	0.228
Pearson's (r)	–	0.376	0.602	0.412	0.678
Model accuracy (Cb)	–	0.562	0.438	0.979	0.336
Goodness of fit (R <sup>2</sup> )	–	0.14	0.36	0.16	0.45
P value (a = 0)	–	0.12	0.32	0.14	0.17
P value (b = 1)	–	0.01	0.02	0.15	0.001
<i>Whole milk (n = 37)</i>					
Mean (pre-weaning phase)	0.477	0.457	0.553	0.388	0.613
Mean bias (Y-X)	–	0.019	–0.076	0.088	–0.136
MSPE	–	0.013	0.010	0.024	0.026
<i>MSPE decomposition (%)</i>					
Mean bias	–	2.747	54.768	31.940	69.474
Systematic bias	–	22.094	1.675	17.663	12.098
Random errors	–	75.158	43.557	50.397	18.428
CCC	–	0.498	0.659	0.230	0.514
Pearson's (r)	–	0.505	0.810	0.306	0.797
Model accuracy (Cb)	–	0.986	0.813	0.751	0.644
Goodness of fit (R <sup>2</sup> )	–	0.25	0.65	0.09	0.63
P value (a = 0)	–	0.001	0.89	0.00004	0.05
P value (b = 1)	–	0.002	0.24	0.06	0.00002

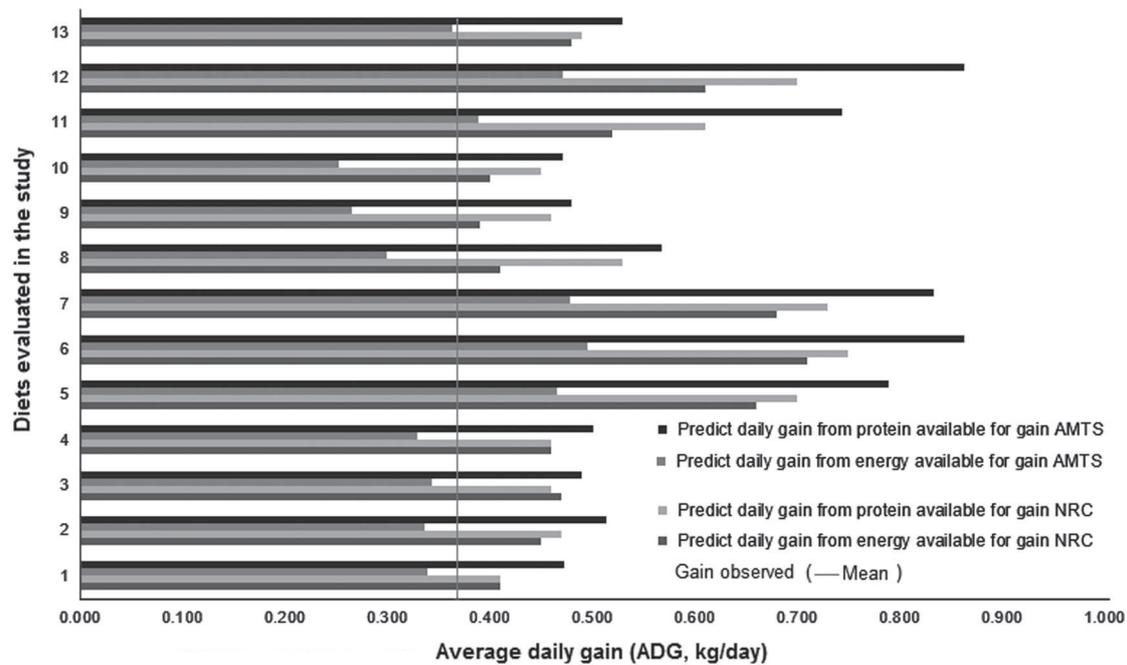
ADP = apparently digested protein; MP = metabolizable protein; MSPE = mean square error of prediction; CCC = concordance correlation coefficient according to Linn (1989); Cb = bias correction factor.

increases of milk or replacer resulted in higher ADG (Brown *et al.*, 2005a and 2005b; Hill *et al.*, 2006). In general, the biological value (BV) and digestibility of milk proteins are higher than those for starter proteins (NRC, 2001). Therefore, increases of starter intake may result in lower BV and digestibility of the diets (Hill *et al.*, 2013).

In the United States, until the 1950s, most dairy calves were fed whole milk (Otterby and Linn, 1981). Currently, a large percentage of calves are fed with milk replacer with different protein sources such as dried skim milk, casein and dried whey. These sources are most frequently used in American dairy farms (National Animal Health Monitoring Service, 2007). On the other hand, in Brazil the most part of calves were yet fed with whole saleable or non-saleable milk, with only 13% of the calves being fed commercial milk replacers (Santos and Bittar, 2015), often with low quality (vegetable protein sources) and nutritional values (low protein and fat). The typical milk replacers have lower energy than whole milk (milk: 5.29 Mcal metabolizable energy (ME)/kg solids *v.* milk replacer: 4.0 to 4.4 Mcal/kg) with 18% to 28% of protein, 15 to 20% fat, <10% ash and <0.15%

crude fiber. In general, fiber levels above 0.15% indicate inclusion of plant origin proteins. In this study the fiber level was of 1.96%; consequently, we infer that many of the milk replacers contained vegetable protein sources at high inclusion rates and, as a result, decreased protein digestibility and BVs would be expected. Liquid diets based on whole milk are expensive and frequently the milk quality used for calves is poor (high somatic cell, bacterial count or antibiotic), which may reduce pre-weaning health and growth of the calf.

The calves fed with whole milk showed higher pre-weaning ADG than calves fed with milk replacer (0.477 *v.* 0.379 kg/day). The composition of milk replacer used in Brazil may have influenced this result. As described, sources of vegetable protein are used frequently in milk replacer formulation for dairy calves. Therefore, use of vegetable proteins with lower BV and digestibility than milk proteins may reduce the growth rate. In addition, the protein (12.5% to 24% dry matter basis) and fat levels (4.9% to 18% dry matter basis) are lower than most of the replacers fed in the United States (Silva and Bittar, unpublished results).



**Figure 2** Relationships of observed and predicted average daily gain (ADG, kg/day) using the calf submodel in the *Nutrient requirements of dairy cattle* (NRC) published in 2001 and Agricultural Modeling and Training Systems (AMTS). Data from Brazilian dairy calves fed only milk replacer.

The pre-weaning ADG of the dairy calves from Brazilian studies were  $0.45 \pm 0.12$  kg/day, with a range from 0.23 to 0.74 kg/day. Soberon *et al.* (2012) described a mean of  $0.82 \pm 0.18$  kg/day of pre-weaning growth rates, with a range from 0.10 to 1.58 kg/day from the Cornell herd. Also, in that study a commercial American dairy farm showed a mean of  $0.66 \pm 0.11$  kg/day, with a range from 0.32 to 1.27 kg/day. However, those ADG were attained with a much higher liquid-diet daily intake, with commercial milk replacers containing 28% CP and either 15% or 20% fat. Bateman *et al.* (2012) reported a total ADG (0 to 56 days) of 0.615 kg/day with a range from 0.129 to 1.161 kg/day. Consequently, the pre-weaning ADG of the Brazilian dairy calves were 27% to 32% lower than reports from American dairy farms, mainly because of the lower liquid-feeding volume.

The low ADG by the Brazilian calf can be linked to colostrum management, availability and quality of milk or milk replacer, and management of the calf on farms. In addition, genetic differences may have been very important. The Brazilian Holstein herd has a smaller mature size, which should be associated with a lower BW gain potential. In the United States, selection for increased milk production has increased the body size and weight of dairy cows, therefore altering the conditions of environment necessary to maintain welfare (Oltenacu and Broom, 2010). The genetic selection for milk production in Brazil was low as compared with that in the United States. The Brazilian dairy herd consists mainly of cross-bred Holstein-Zebu cows, with a significant number of crosses between Holstein and Gyr cows (Madalena *et al.*, 2012). The Gyr breed has a lower birth weight than Holsteins. It is important to consider that our data set was

developed with 71% of Brazilian Holstein and 23% cross-bred Holstein  $\times$  Zebu calves.

Management differences may also be relevant. In Asia and other tropical countries, inadequate heifer management is a main problem for numerous small holder dairy farms (Moran, 2011). In the South of Brazil, 71% of 242 smallholder families reported that diarrhea was the main cause of calf mortality (Hotzel *et al.*, 2014). Santos and Bittar (2015) reported that in three important milk production regions from Brazil almost 48% of all calves present diarrhea and that 22% have respiratory problems. Most of the problems are not only related to failure of passive transfer of immunity because of inadequate colostrum feeding, but also to inadequate housing conditions.

The starter intake over the total trial period was  $0.518 \pm 0.201$  kg/day, with a range from 0.180 to 0.960 kg/day. Bateman *et al.* (2012) reported a starter intake mean of  $0.894 \pm 0.242$  kg/day with a range from 0.134 to 1.592 kg/day during pre-weaning phase. In addition, their study reported that starter intake had the greatest effect on ADG during the 56-day growth period. In the present study, a low starter intake is in agreement with lower ADG of the Brazilian dairy calves, and may reflect temperature effects on dry matter intake and increased energy requirements as a result of the tropical conditions. Furthermore, a lower intake may be explained by lower growth potential as well as management and health problems.

#### *Energy-allowable gain*

The NRC (2001) and AMTS models use ME as the respective energy term. The NRC (2001) nutrient requirements are based on a database of Holstein veal calves fed with high-fat diets. For those cases, there is extra fat per unit of weight

gain. In general, dairy calves have lower fat and greater protein retained per unit of weight gain than veal calves (Van Amburgh *et al.*, 2009). Van Amburgh and Drackley (2005) reviewed data from tissue-deposition trials from Holstein calves fed modern milk replacers containing whey proteins, relative to NRC (2001) requirements. This study resulted in an update of the NRC (2001) equations. The updates suggested by Van Amburgh and Drackley (2005) were inputted into the AMTS model.

The ADG of the calves fed with milk replacer predicted by energy-allowable gains from the AMTS model showed the lowest MSPE and higher C<sub>b</sub> value. The MSPE is used to estimate the predictive accuracy of a model (Tedeschi, 2006). Therefore, in the tropical conditions the AMTS model showed better accuracy than NRC (2001) for estimating ADG of dairy calves fed with milk replacer, probably as a result of adjusted equations from Van Amburgh and Drackley (2005), which considered the composition of the gain.

On the other hand, the  $R^2$  was very low for both models (energy-allowable gain  $R^2 < 0.25$  and protein-allowable gain  $R^2 < 0.65$ ). The low  $R^2$  values represent a low precision for estimating ADG of Brazilian dairy calves. The ADG predicted by dietary energy was more accurate than precise, because the accuracy (C<sub>b</sub>) had to be higher than the  $r$ . In this study, the limitation for the analysis was the low number of calves fed with milk replacer in Brazil. Therefore, it is suggested that a future evaluation with a higher number of calves fed with modern milk replacers be conducted as data become available.

In the United States, a recent evaluation of the NRC (2001) calf model was made using 996 individual data from dairy calves. Hill *et al.* (2013) used the lowest ADG value predicted by the ME or apparently digestible protein (ADP) allowable gain and regressed those against observed ADG. The study reported that the NRC (2001) was inaccurate in predicting ADG when a data set from a wide range of feeding programs in a commercial management setting was used. The  $R^2$  was low ( $R^2 = 0.42$ ) and NRC (2001) model resulted in under-prediction of the ADG from calves with high rates gain (>700 g/day).

Several factors may influence ADG of calves in tropical conditions. The higher temperature in the summer may decrease starter intake and reduce ADG (McKnight, 1978). In tropical conditions, calves may suffer with heat stress, which may reduce starter intake and the health of animals. In the same time, there is an increase in maintenance requirements. Another aspect is that sick calves may use dietary energy for the immune system (Martin *et al.*, 2003), instead of growth. All these factors may have contributed to the observed lower ADG.

According to Hill *et al.* (2013), the accuracy of the ADG predictions for pre-weaning dairy calves is commonly not high, because there are several different factors that impact ADG. Gain can be responsive to a complexity of dietary changes, BVs, metabolic coefficients for different nutrient types, effect of colostrum intake on health, physiological changes from a glucose-utilizing to a gluconeogenesis

metabolism system, environmental temperature and management practices that stress the calf.

The low calf starter intake during the pre-weaning phase in the Brazilian data set limited energy used for ADG. This low intake could be a result of lower genetic growth potential, management, dietary constraints or overstress of the calf and health problems. The low performance of Brazilian dairy calves suggest that energy that potentially could be used for gain may have been used instead for other physiological processes, such as fighting diseases (diarrhea and pneumonia) and minimizing heat stress effects.

#### *Protein-allowable gain*

The ADP allowable gain from NRC (2001) and metabolizable protein-allowable gain from AMTS were evaluated. The NRC (2001) adopted the factorial method from Blaxter and Mitchell (1948) to estimate protein requirements of dairy calves with weight up to 100 kg. The last NRC edition described the protein requirements for maintenance and gain.

The AMTS has a mechanistic calf model that is based on the NRC model as updated with new requirements suggested by Van Amburgh and Drackley (2005). This update indicated that the protein requirement is higher than predicted by the NRC publication, due to difference in the assumed efficiency of protein use. The NRC (2001) calculations suggested that absorbed protein was used with an efficiency of 0.80. The Van Amburgh and Drackley (2005) modifications suggest that the efficiency is closer to 0.70; consequently, the actual requirements are 10% to 12% higher than the current NRC predictions.

Under the conditions of our study, dietary protein-allowable gain was greater than observed ADG for calves fed whole milk, milk replacer or both. An important aspect is that the energy-allowable gain predicted by the models was more limiting than protein-allowable gain (Tables 5 and 6) for conventional milk-feeding systems used in Brazilian trials. The protein to energy ratio of the diet can change efficiency and composition of live weight gain (Van Amburgh and Drackley, 2005). The protein requirement is a function of the energy-allowable gain and adequate ratios of CP to energy are important to maximize ADG of the animal (Hill *et al.*, 2009).

According to National Research Council (NRC) (1996) the ME is defined as gross energy minus fecal energy, urinary energy and gaseous energy losses. A study published by Hill *et al.* (2009) described that in calves fed low ME intakes (3.26 Mcal/day or 0.0656 Mcal/kg of BW daily) the maximum ADG was reached with 51.5 g of CP/Mcal of ME. However, calves fed with high ME intake (3.71 Mcal/day or 0.0743 Mcal/kg of BW daily) required 55.0 g of CP/Mcal of ME to maximize ADG. In this meta-analytical study, diets for dairy calves provided an average of  $57 \pm 7.2$  g CP/Mcal of ME, and would be considered as low ME intakes (0.067 Mcal/kg of BW daily) according to the Hill *et al.* (2009) analysis. In Brazil, the data suggest a necessity to increase ME intake of the diets, in order to meet the optimum ratio of 51.5 g of CP/Mcal as described by Hill *et al.* (2009).

The weight gain estimated by the energy available from the diet was overestimated by 19 g/day when calculated by the NRC and underestimated by 68 g/day when calculated by AMTS. When gains were estimated by protein available in the experimental diets both the AMTS and the NRC showed greater overestimation of gain than when energy-allowable gain was used. In the conditions of this study, the proposed Van Amburgh and Drackley (2005) seems to be more accurate in predicting the performance of dairy calves fed milk replacers. The Brazilian data showed a calf gain around 32% lower than those described in United States dairy farms. The reasons for this discrepancy need to be understood, for only then new models could be developed and parameterized to estimate animal performance in tropical conditions more accurately and precisely.

### Acknowledgements

This work was supported by São Paulo Research Foundation (FAPESP), grant number 14/12475-6. Appreciation is extended to the University of Illinois, Department of Animal Sciences, Urbana, IL, and to the Dairy Focus Lab at that institution. Thanks to Dr Tom Tylutki and Mariann Fessenden.

### References

- Agricultural and Food Research Council (AFRC) 1993. Energy and protein requirements of ruminants. An Advisory Manual Prepared by the AFRC Technical Committee on Responses to Nutrients. CAB International, Wallingford, UK.
- Aita MF, Fischer V and Stumpf W Jr 2006. Effects of different ether extract levels of a milk replacer on body development of Jersey calves. *Brazilian Journal of Animal Science* 35, 193–202.
- Azevedo RA, Rufino SRA, Duarte DVL, Soares ACM and Geraseev LC 2014. Performance of dairy calves in artificial fed milk conventional or fractionated. *Brazilian Journal of Animal Health and Production* 15, 237–247.
- Bateman HG, Hill TM, Aldrich JM, Schlotterbeck RL and Firkins JL 2012. Meta-analysis of the impact of initial serum protein concentration and empirical prediction model for growth of neonatal Holstein calves through 8 weeks of age. *Journal of Dairy Science* 95, 363–369.
- Batista CG, Coelho SG, Rabelo E, Lana AMQ, Carvalho AU, Reis RB and Saturnino HM 2008. Performance and health of calves fed milk without antimicrobials residue or milk from mastitis treated cows with or without probiotic. *Brazilian Journal of Veterinary and Animal Sciences* 60, 185–191.
- Bibby J and Toutenburg H 1977. Prediction and improved estimation in linear models. John Wiley & Sons, Berlin, Germany.
- Bittar CMM, Ferreira LS, Santos FAP and Zopollatto M 2009. Performance and ruminal development of dairy calves fed starter concentrate with different physical forms. *Brazilian Journal of Animal Science* 38, 1561–1567.
- Blaxter KL and Mitchell HH 1948. The factorization of the protein requirements of ruminants and of the protein value of feeds, with particular reference to the significance of the metabolic fecal nitrogen. *Journal of Animal Science* 7, 351–372.
- Brown EG, Vandehaar MJ, Daniels KM, Liesman JS, Chapin LT, Forrest JW, Akers RM, Pearson RE and Weber Nielsen MS 2005a. Effect of increasing energy and protein intake on mammary development in heifer calves. *Journal of Dairy Science* 88, 595–603.
- Brown EG, Vandehaar MJ, Daniels KM, Liesman JS, Chapin LT, Keisler DH and Weber Nielsen MS 2005b. Effect of increasing energy and protein intake on body growth and carcass composition of heifer calves. *Journal of Dairy Science* 88, 585–594.
- Chaves AH, Silva JFC, Campos OF, Pinheiro AJR and Valadares Filho SC 1999. Effect of one strain of *Lactobacillus acidophilus* (LT 516) as probiotic for calves. *Brazilian Journal of Animal Science* 28, 1075–1085.
- Commonwealth Scientific and Industrial Research Organisation 1990. Feeding standards for Australian livestock: ruminants. Compiled by the Ruminants Subcommittee of the Standing Committee on Agriculture. CSIRO, East Melbourne, Australia.
- Davis CL and Clark JH 1981. Ruminant digestion and metabolism. *Developments in Industrial Microbiology* 22, 247–259.
- Davis CL and Drackley JK 1998. The development, nutrition and management of the young calf. Iowa State University Press, Ames, IA, USA.
- Ferreira LS, Bittar CMM, Silva JT, Soares MC, Oltramari CE, Nápoles GGO and Paula MR 2013. Performance and plasma metabolites of dairy calves fed a milk replacer or colostrum silage. *Brazilian Journal of Veterinary and Animal Sciences* 65, 1357–1366.
- Fox DG, Sniffen CJ, O'Connor JD, Russell JB and Van Soest PJ 1992. A net carbohydrate and protein system for evaluating cattle diets: III. Cattle requirements and diet adequacy. *Journal of Animal Science* 70, 3578–3596.
- Fox DG, Tedeschi LO, Tylutki TP, Russell JB, Van Amburgh ME, Chase LE, Pell AN and Overton TR 2004. The Cornell Net Carbohydrate and Protein System model for evaluating herd nutrition and nutrient excretion. *Animal Feed Science and Technology* 112, 29–78.
- Fuentes-Pila J, Ibañez M, De Miguel JM and Beede DK 2003. Predicting average feed intake of lactating Holstein cows fed totally mixed rations. *Journal of Dairy Science* 86, 309–323.
- Gonsalves Neto J, Silva FF, Bonomo P, Nascimento PVN, Fernandes ASA, Pedreira MS, Velloso CM and Teixeira FA 2008. Performance of Holstein calves fed ground or pelleted concentrate. *Brazilian Journal of Animal Health and Production* 9, 726–733.
- Hill TM, Aldrich JM, Schlotterbeck RL and Bateman HG 2006. Effects of feeding calves different rates and protein concentrations of twenty percent fat milk replacers on growth during the neonatal period. *The Professional Animal Scientist* 22, 252–260.
- Hill TM, Bateman HG, Aldrich JM and Schlotterbeck RL 2009. Optimizing nutrient ratios in milk replacers for calves less than five weeks of age. *Journal of Dairy Science* 92, 3281–3291.
- Hill TM, Bateman HG, Quigley JD, Aldrich JM, Schlotterbeck RL and Heinrichs AJ 2013. Review: new information on the protein requirements and diet formulation for dairy calves and heifers since the Dairy NRC 2001. *The Professional Animal Scientist* 29, 199–207.
- Hotzel MJ, Longo C, Balcão LF, Cardoso CS and Costa JHC 2014. A survey of management practices that influence performance and welfare of dairy calves reared in Southern Brazil. *PLoS One* 9, 1–17.
- Institute National de la Recherche Agronomique 1989. Ruminant nutrition, recommended allowances & feed tables. John Libbey Eurotext, Montrouge, France.
- Jorge JRV, Zeoula LM, Prado IN and Geron LJV 2002. Replacement of corn for cassava meal (*Manihot esculenta*, Crantz) in the Holstein calves diets. 1. Performance and blood parameters. *Brazilian Journal of Animal Science* 31, 192–201.
- Khan MA, Weary DM and Von Keyserlingk MAG 2011. Invited review: effects of milk ration on solid feed intake, weaning, and performance in dairy heifers. *Journal of Dairy Science* 94, 1071–1081.
- Lima PO, Cândido MJD, Monte ALS, Lima RN, Miranda MVFG, Aquino RMS, Moreira RHR and Leite HMS 2013. Carcass characteristics and live weight components of calves receiving different liquid diets. *Ciência Rural* 43, 2056–2062.
- Lin L 1989. A concordance correlation coefficient to evaluate reproducibility. *Biometrics* 45, 255–268.
- Lizeire RS, Cunha DNFV, Martuscello JA and Campos OF 2002. Roughage for pre-ruminant calves. *Ciência Rural* 32, 835–840.
- Madalena FE, Peixoto MGCD and Gibson J 2012. Dairy cattle genetics and its applications in Brazil. *Livestock Research for Rural Development* 24, 97.
- Mancio AB, Toniassi RH, Goes B, Castro ALM, Campos OF, Cecon PR and Silva ATS 2005. Effects of replacing milk with fermented colostrum, with or without soy oil and growth promoter for crossbred dairy calves. *Brazilian Journal of Animal Science* 34, 1314–1319.
- Martin LB, Scheuerlein A and Wikelski M 2003. Immune activity elevates energy expenditure of house sparrows: a link between direct and indirect costs. *Proceedings of the Royal Society of London B Biological Sciences* 270, 153–158.

- McKnight DR 1978. Performance of newborn dairy calves in hutch housing. *Canadian Journal of Animal Science* 58, 517–520.
- Meyer PM, Pires AV, Bagaldo AR, Simas JMC and Susin I 2001. Addition of probiotic to whole milk or milk replacer and Holstein calves performance. *Scientia Agricola* 58, 215–221.
- Moran JB 2011. Factors affecting high mortality rates of dairy replacement calves and heifers in the tropics and strategies for their reduction. *Asian-Australasian Journal of Animal Sciences* 24, 1318–1328.
- National Animal Health Monitoring Service 2007. Heifer calf health and management practices on U.S. dairy operations. USDA-APHIS-VS. Retrieved on 1 April 2015 from [http://www.aphis.usda.gov/animal\\_health/nahms/dairy/downloads/dairy07/Dairy07\\_ir\\_CalfHealth.pdf](http://www.aphis.usda.gov/animal_health/nahms/dairy/downloads/dairy07/Dairy07_ir_CalfHealth.pdf)
- National Research Council (NRC) 1996. Nutrient requirements of beef cattle, 7th revised edition. National Academies Press, Washington, DC, USA.
- National Research Council (NRC) 2001. Nutrient requirements of dairy cattle, 7th revised edition. National Academies Press, Washington, DC, USA.
- Olsen J 1995. Meta-analysis or collaborative studies. *Journal of Occupational and Environmental Medicine* 37, 897–902.
- Oltenu PA and Broom DM 2010. The impact of genetic selection for increased milk yield on the welfare of dairy cows. *Animal Welfare* 19, 39–49.
- Otterby DE and Linn JG 1981. Advances in nutrition and management of calves and heifers. *Journal of Dairy Science* 64, 1365–1377.
- R Development Core Team 2014. R: A Language and Environment for Statistical Computing. Version 3.1.1. R Foundation for Statistical Computing, Vienna, Austria. Retrieved on 1 July 2014 from <http://www.R-project.org>
- Sandi D and Mühlbach PRF 2001. Performance of Holstein bull calves weaned at 28 or 56 days of age, with or without additive based on mannanoligosaccharide. *Ciência Rural* 31, 487–490.
- Santos G and Bittar CMM 2015. A survey of dairy calf management practices in some producing regions in Brazil. *Brazilian Journal of Animal Science* 44, 361–370.
- SAS Institute 2008. SAS/STAT Software version 9.1. SAS Institute Inc., Cary, NC, USA.
- Sauvant D, Schmidely P, Daudin JJ and St-Pierre NR 2008. Meta-analyses of experimental data in animal nutrition. *Animal* 2, 1203–1214.
- Schalch FJ, Schalch E, Zanetti MA and Brisola ML 2001. Substitution of the corn grain ground by citric pulp in the early weaning of dairy calves. *Brazilian Journal of Animal Science* 30, 280–285.
- Scientific Electronic Library Online 2014. Retrieved on 10 October 2014 from <http://www.scielo.org>
- Silva JT, Bittar CMM and Ferreira LS 2012. Evaluation of mannan-oligosaccharides offered in milk replacers or calf starters and their effect on performance and rumen development of dairy calves. *Brazilian Journal of Animal Science* 41, 746–752.
- Soberon F, Raffrenato E, Everett RW and Van Amburgh ME 2012. Pre-weaning milk replacer intake and effects on long-term productivity of dairy calves. *Journal of Dairy Science* 95, 783–793.
- Tedeschi LO 2006. Assessment of the adequacy of mathematical models. *Agricultural Systems* 89, 225–247.
- Tylutki TP, Fox DG, Durbal VM, Tedeschi LO, Russell JB, Van Amburgh ME, Overton TR, Chase LE and Pell AN 2008. Cornell Net Carbohydrate and Protein System: a model for precision feeding of dairy cattle. *Animal Feed Science and Technology* 143, 174–202.
- Van Amburgh ME and Drackley JK 2005. Current perspectives on the energy and protein requirements of the pre-weaned calf. In *Principles of rearing the modern dairy heifer from calf to calving* (ed. PC Garnsworthy), pp. 67–82. Nottingham University Press, Nottingham, UK.
- Van Amburgh ME, Raffrenato E, Soberon F and Everett RW 2009. Early life management and long-term productivity of dairy calves. *Proceedings of the Florida Ruminant Nutrition Symposium*, 10–11 February 2009, University of Florida, Gainesville, FL, USA. Retrieved on 5 January 2015 from [http://dairy.ifas.ufl.edu/rns/2009/Van\\_Amburgh.pdf](http://dairy.ifas.ufl.edu/rns/2009/Van_Amburgh.pdf)
- Vanden Berg GE 1980. Systematic procedures for planning research. US Department of Agriculture, Science and Education Administration. *Agricultural Reviews and Manuals*. Northeastern Series USDA, Beltsville, MD, USA.
- Vasconcelos AM, Moraes DAEF, Olivo CJ, Farias DA, Saenz EAC, Landim AV, Gomes TCL, Rogério MCP, Goés KLS, Nascimento JR and Oliveira Júnior AA 2009. Performance of dairy calves under different liquid diets and facilities during the winter period. *Acta Veterinaria Brasilica* 3, 163–171.